(a)

- 1. In terms of learning mechanism, ALS fixes one matrix (user or item) and solves for the other matrix using a least squares solution for each iteration. It iterates between the two until convergence. Neural networks adjust all model parameters simultaneously in the direction of the gradient of the loss function.
- 2. In terms of training procedure, ALS iterates through the dataset a fixed number of times. It solves for the latent factors based on the observed data. Neural networks require iterative gradient-based optimization methods, which require more resources and time to converge.
- 3. In terms of model complexity, ALS assumes a linear relationship between latent features and the observed data. Neural networks are more flexible and can learn non-linear mappings between inputs and outputs.
- (b) Completed in py file.

(c)

Best hyperparameters after tuning: Learning Rate = 0.01, Epoch = 50

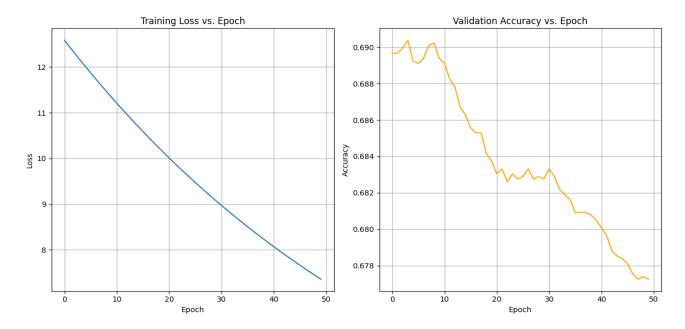
Best k is k=50, final val accuracy: 0.6899520180637877

(d)

For simplicity of report, I will only include 10 epoch out of 50.

Epoch: 0	Training Cost: 13829.133494	Valid Acc: 0.6079593564775614
Epoch: 4	Training Cost: 12102.364188	Valid Acc: 0.6296923511148744
Epoch: 9	Training Cost: 11360.841694	Valid Acc: 0.6469093988145639
Epoch: 14	Training Cost: 10571.371426	Valid Acc: 0.6685012701100762
Epoch: 19	Training Cost: 9879.575640 V	alid Acc: 0.6778154106689246
Epoch: 24	Training Cost: 9280.609459 V	alid Acc: 0.6831780976573525
Epoch: 29	Training Cost: 8737.958469 V	alid Acc: 0.6881174146203782
Epoch: 34	Training Cost: 8234.091507 V	alid Acc: 0.6888230313293818
Epoch: 39	Training Cost: 7761.313794 V	alid Acc: 0.6896697713801863
Epoch: 44	Training Cost: 7316.935498 V	alid Acc: 0.6900931414055885
Epoch: 49	Training Cost: 6900.086466 V	alid Acc: 0.6899520180637877

## Final Test accuracy: 0.6663844199830652



(e)

Best lambda is 0.001, Val accuracy: 0.688258537962179

Final Test accuracy with best k=50 and best lambda=0.001: 0.6830369743155518

Yes, the model does perform better with regularization penalty.